Zero-shot classification of ECG signals using a CLIP-based model

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# Introduction

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# Related Works

# Materials and Methodology

# Results

# Discussion

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